

# Physics-based Approach to Density Estimation and Prediction using Orbital Debris Tracking Data



Shaylah Mutschler, Penina Axelrad, Tomoko Matsuo, Eric Sutton  
University of Colorado Boulder



## THE VISION

Harness the orbital debris population as indirect sensors to estimate parameters of the space environment.

## OBJECTIVE

Develop a method that estimates forcing parameters of a physics-based space environment model to allow for improved atmospheric density estimates and Low Earth Orbit (LEO) space object motion predictions.

## BACKGROUND

- A key requirement for accurate space object trajectory prediction is knowledge of the non-conservative forces affecting these objects. These effects vary temporally and spatially and are primarily driven by the dynamical behavior of space weather.
- Of all catalogued space objects, 95% are rocket bodies, inactive satellites, or debris, yet their data are still not used for the benefit of updating and adjusting space weather models [1].
- The uncontrolled nature of debris objects can make them particularly sensitive to the variations of space weather.



Fig. 1

- This research focuses on the LEO regime where mismodeling of atmospheric drag is the largest contributor to orbit prediction error.

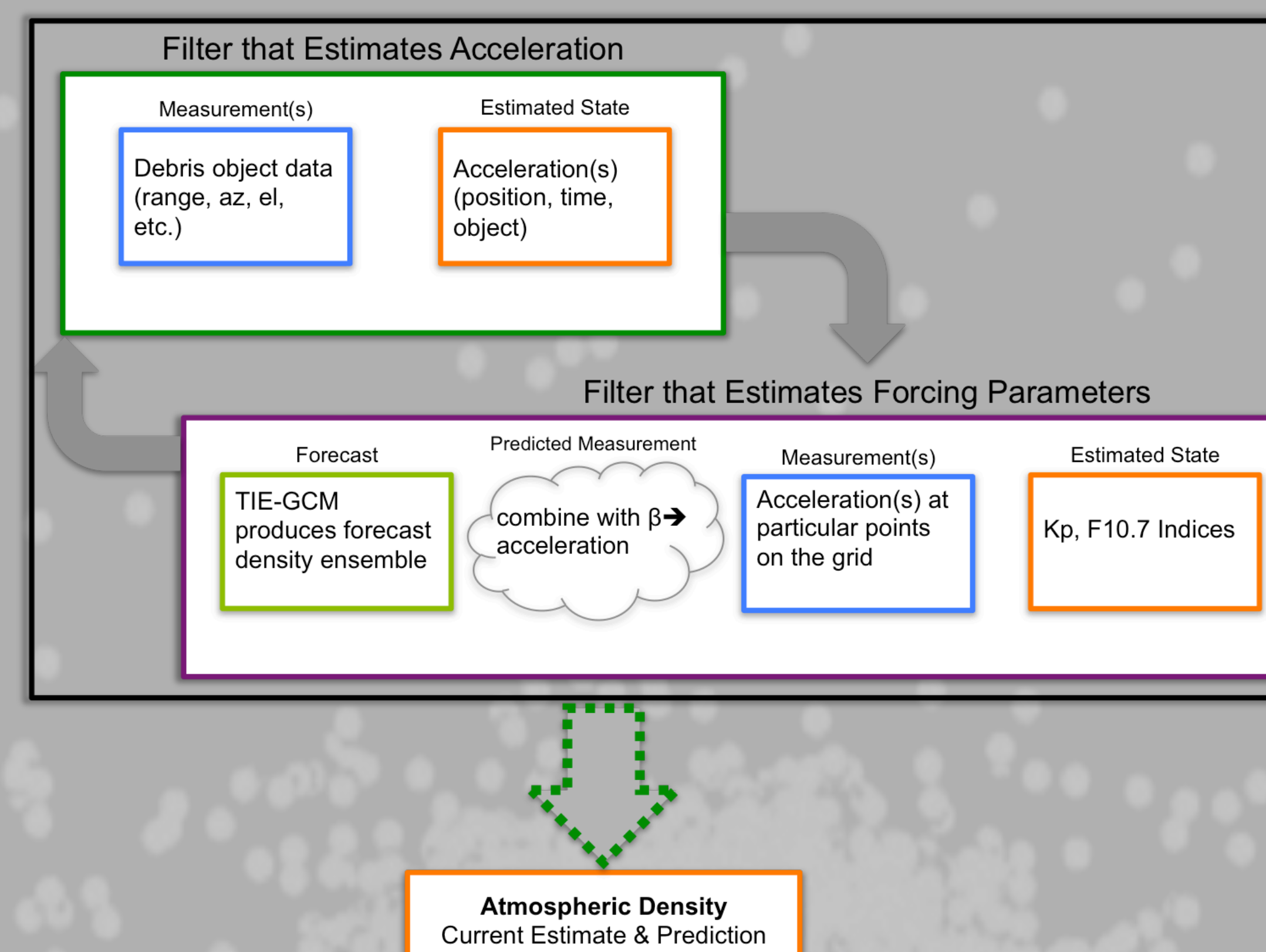
## PRIOR WORK

- High Accuracy Satellite Drag Model (HASDM) [2]
  - Observations of carefully selected LEO objects, ~500 observations per day per object
  - Estimates 13 spherical harmonic temperature and density correction coefficients
- Direct Density Correction Method (DDCM) [3]
  - Observations from 16 objects
  - Estimates two correction coefficients to an existing density model
- Emmert, et al. used 5000 TLEs to correct a global density model [4]
- Our work:
  - Aims to take advantage of all debris objects, instead of a small, handpicked portion
  - Estimates forcing parameters of the Thermosphere Ionosphere Electrodynamic General Circulation Model (TIE-GCM)<sup>5</sup>

## METHOD

Our tool consists of two filters within a closed-loop feedback system:

1. An Unscented Kalman Filter (UKF) utilizes debris object tracking data in the form of measurements collected from ground sensors to estimate acceleration due to atmospheric drag
2. A Particle Filter or Ensemble Square Root Filter (EnSRF) estimates forcing parameters of TIE-GCM using acceleration due to atmospheric drag (from first filter) as measurements



## IMPLEMENTATION

Acceleration due to drag is defined as

$$a_{drag} = -\frac{1}{2} \rho \frac{C_D A}{m} v_{rel}^2 \frac{\vec{v}_{rel}}{|\vec{v}_{rel}|}$$

$$\vec{v}_{rel} = \frac{d\vec{r}}{dt} - \vec{\omega}_{\oplus} \times \vec{r}$$

This expression can be expressed in terms of three major components: density ( $\rho$ ), ballistic coefficient ( $\beta$ ), and the relative velocity terms ( $v_{rel}$  term)

$$a_{drag} = -\frac{1}{2} \rho \beta v_{rel} \text{ term}$$

UKF (first filter):

- Measurements: debris object range, azimuth, & elevation
- Estimated State: debris object position, velocity, &  $a_{drag}$
- Does not require any information about the density or ballistic coefficient
- The  $a_{drag}$  estimates, as well as time, position (altitude, latitude, Local Sidereal Time), and debris object information are passed to the second filter

EnSRF (second filter):

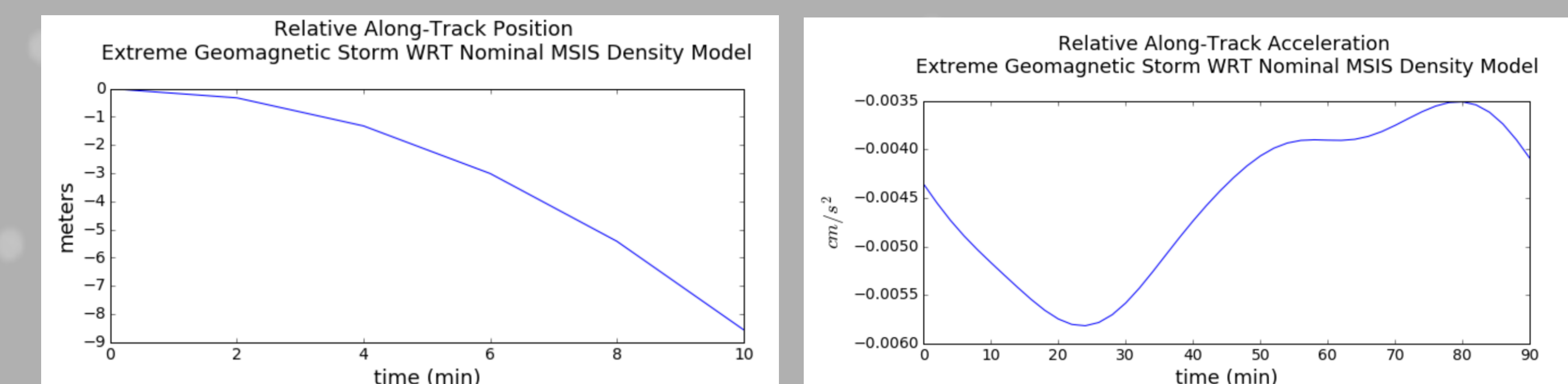
- Measurements:  $a_{drag}$  (altitude, latitude, LST, debris object) from first filter
- Estimated State: Kp and F10.7 indices
- TIE-GCM is used to generate an ensemble of forecast density in the filter
- The density ensemble combined with corresponding debris object ballistic coefficients forms a predicted acceleration measurement.

$$a_{drag \text{ predicted}} = -\frac{1}{2} \rho_{forecast} \beta v_{rel} \text{ term}$$

- Corrections are applied to the ensemble of predicted acceleration measurements using the first filter's acceleration estimates as measurements.

## OBSERVABILITY

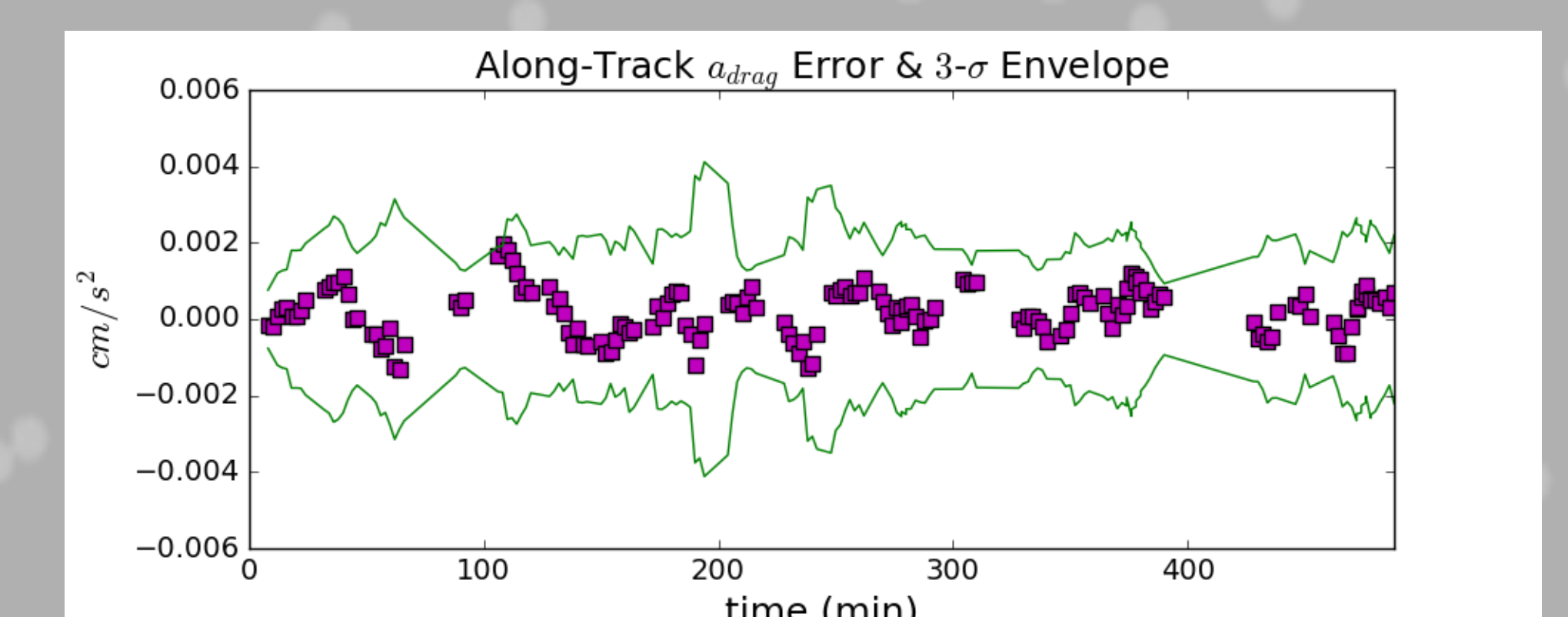
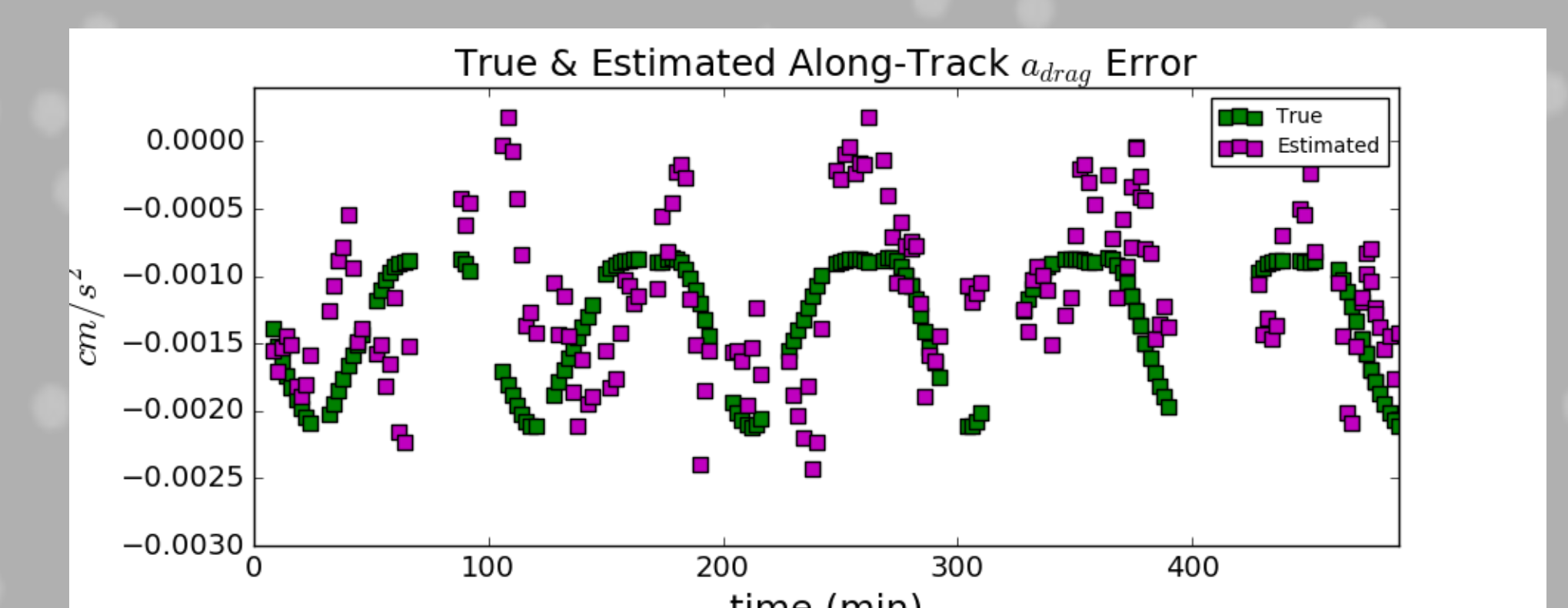
- A LEO object is propagated using two different density conditions (via MSIS<sup>6</sup>):
  1. Nominal/calm conditions (127 F10.7, 17 Ap)
  2. Extreme geomagnetic storm (273 F10.7, 400 Ap)
- The trajectory of the object orbiting through storms conditions is plotted with respect to (WRT) the object orbiting through nominal conditions



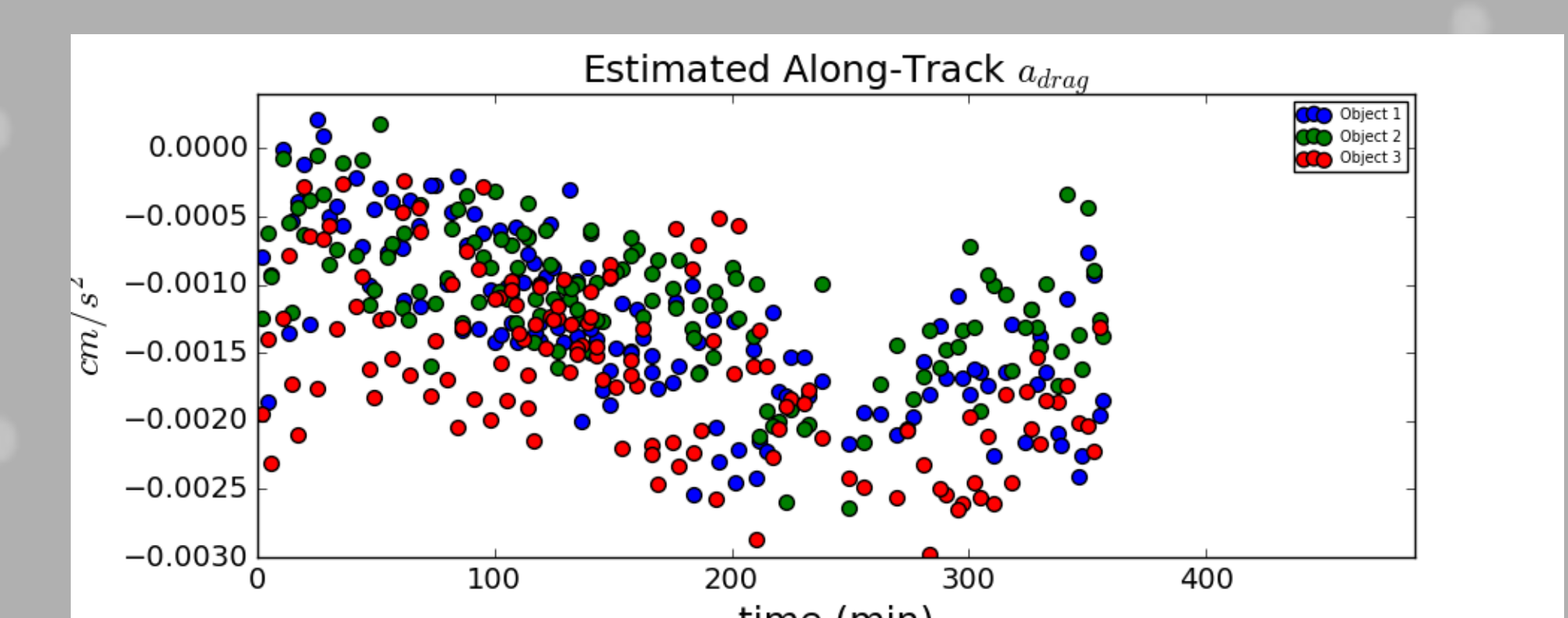
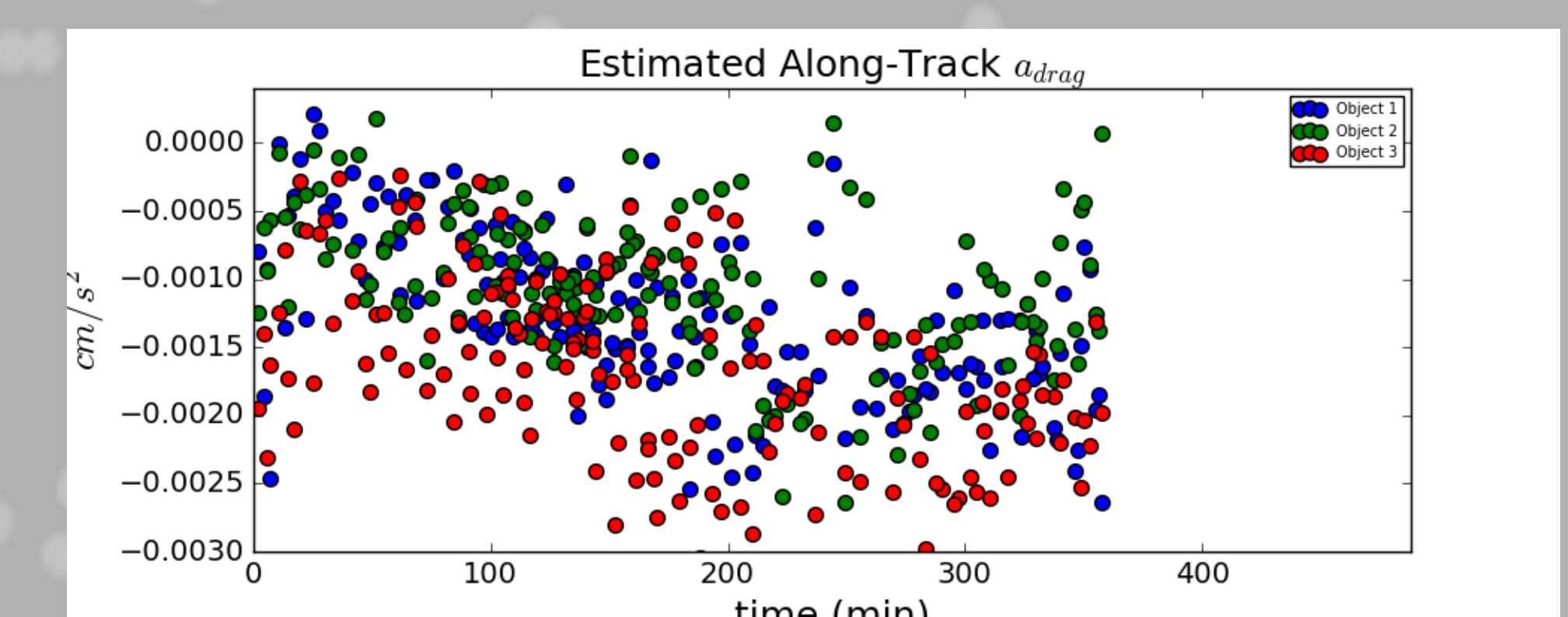
- Difference in relative position after 2 minutes is .32 meters. This difference in relative position continues to grow for the remainder of the simulation.
- Ground sensors measure range (1- $\sigma$ : .5m), azimuth & elevation (1- $\sigma$ : 5 arcseconds = 9.7m) from which  $a_{drag}$  can be estimated

## RESULTS

- UKF estimates  $a_{drag}$  of simulated LEO object orbiting through nominal density (MSIS generated density field)



- UKF run multiple times for objects with varying  $\beta$
- Plot below shows all objects'  $a_{drag}$  as a function of LST (showing  $a_{drag}$  for all times & times after 90 minutes/first orbit (after filter converges))



1. USSTRATCOM Space Control and Space Surveillance. Stratcom.mil. U.S. Strategic Command, 17 Oct. 2016. Web. 5 Sep. 2017.  
 2. Storz, M.F., Bowman, B.R., Branson, J.I., Casali, S.J., Tobiska, W.K., 2005. High Accuracy Satellite Drag Model (HASDM). Advances in Space Research, 36 (12), 2497-2505.  
 3. Yurasov, V., Nazarenko, A., Alfriend, K., Cefola, P., 2006. Direct Density Correction Method: Review of Results. In: 57th International Astronautical Congress Conference.  
 4. Emmert, J., et al., 2008. Thermospheric Global Average Density Trends, 1967–2007, Derived from Orbits of 5000 Near-Earth Objects. Geophysical Research Letters, 35. 10.1029/2007GL032809.  
 5. Roble, R. G., and E. C. Ridley. 1994. A thermosphere-ionosphere- mesosphere-electrodynamics general circulation model (TIE-GCM): Equinox solar cycle minimum simulations (30–500 km). Geophys. Res. Lett., 21 (6), 417–420.  
 6. Picone, J. M., Hedin, A. E., Drob, D. P., Aikin, A. C. 2002. NRLMSISE-00 Empirical Model of the Atmosphere: Statistical Comparisons and Scientific Issues. Journal of Geophysical Research. 107 (A12), 1468.

Fig.1: thespacereporter.com/2015/05/iss-may-gain-a-laser-cannon-for-blasting-space-debris